

Vortex Model Based Adaptive Flight Control Using Synthetic Jets

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August 20, 2008



Overview

- 1 Introduction
- 2 Experiment Hardware
 - Wind Tunnel Traverse
 - Wing and Actuators
- 3 Nominal Control Design
 - Actuation Modeled as a Static Device
 - Nonlinear Vortex Model
 - “Linear” Vortex Model
 - Coupled Vortex/Rigid Body Model
 - Nominal Control Designs
- 4 Adaptive Control Design
 - Plant Dynamics/Reference Behavior
 - Adaptive Control Implementation
 - Saturation Protection
- 5 Experimental Results
 - Determining Model Parameters
 - Model Validation
 - Closed Loop Experiments

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Introduction

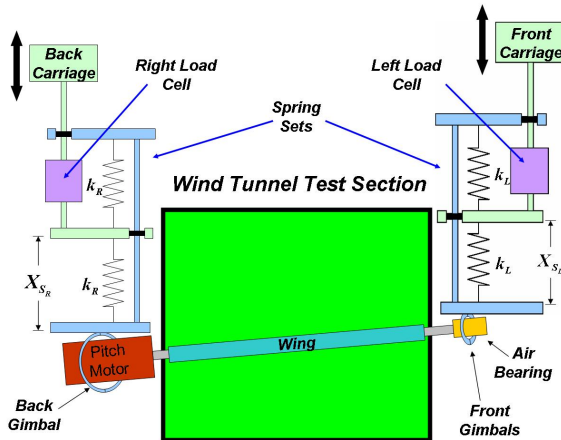
- Aerodynamic flow control.
- Enable highly-maneuverable flight for small UAVs (e.g., in confined spaces).
 - No moving control surfaces.
 - Maneuver on convective time scale (Dragon Eye scales: 20 m/s, c 30cm, $t_{conv} = 15 \text{ msec}$)
- Flight dynamics and flow dynamics are coupled.
 - Flow develops forces and moments on convective time scales.
 - Flow state is affected by both vehicle dynamics and actuation.



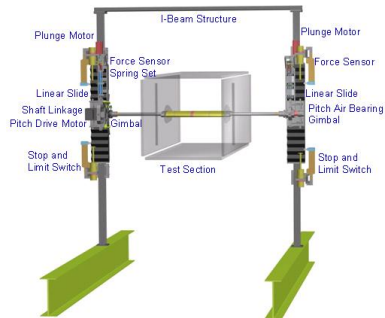
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Experiment Diagram



Traverse

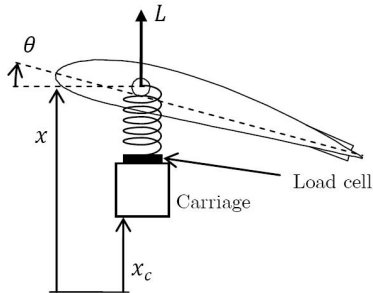


Force Control

- **Purpose:** Simulation of longitudinal free flight in a wind tunnel.
- A force control technique was developed to accomplish this.
- Force control maintains prescribed force/moment on model.
 - Removes effect of gravity.
 - Hides traverse nonlinearities from model.
 - Applies prescribed force commands to the traverse.
 - Feedback of wing states alters dynamics of flying model.
- Force is applied by regulating the deflection of the springs in the traverse.
- Moment applied via torque motor.



Traverse Mechanism



- Inner loop PID control laws regulate the carriage positions.
- Force control law commands accelerations to the carriages.
- Allows regulation of the spring deflection on the airfoil.

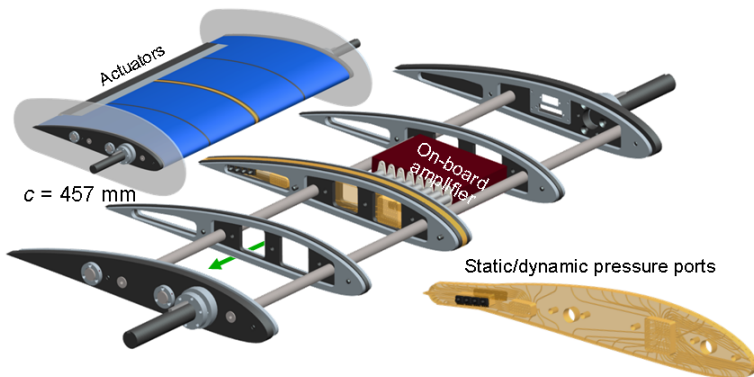


Wing Model

- 1m span NACA 4415 wing section
- Chord length is 457 mm.
- Modular and comprised of interchangeable spanwise segments for sensors.
- Includes module of a circumferential array of 70 static pressure ports located at mid-span.
- Several modules of high-frequency integrated pressure sensors for measurements of instantaneous pressure.

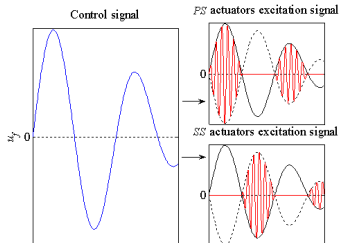


Wing Section



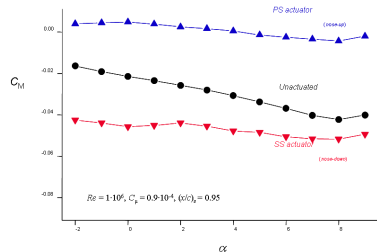
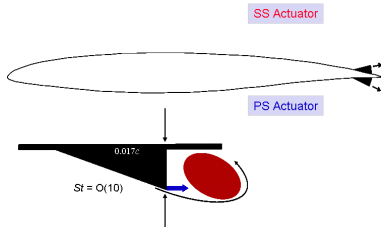
Flow Control Actuators

- Synthetic jet type actuators.
- Array of jets mounted on trailing edge of wing.
- Actuators are amplitude modulated.



- Characteristic actuation rise time $O(2-3t_{conv})$.
- Usable control authority up to 30 Hz in pitch.

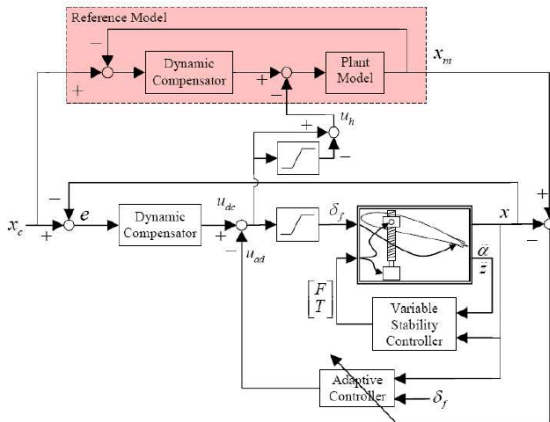




- Hybrid actuators on opposite sides of the trailing edge allow C_M to be varied bidirectionally without moving surfaces.
 - Manipulates concentrations of trapped vorticity.
 - PS actuator increases C_M (nose-up).
 - SS actuator decreases C_M (nose-down).
- Significant changes in C_M with minimal lift and drag penalty
- Changes in actuator C_μ allow aerodynamic performance to be continuously varied



System, Concept



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Static Actuator Model of the Wing

- The effect of an actuator is modeled as a static moment actuator.
- The lift and moment can be modeled as

$$L = QS (C_{L_0} + C_{L_\alpha} \alpha + C_{L_{\dot{\alpha}}} \dot{\alpha})$$

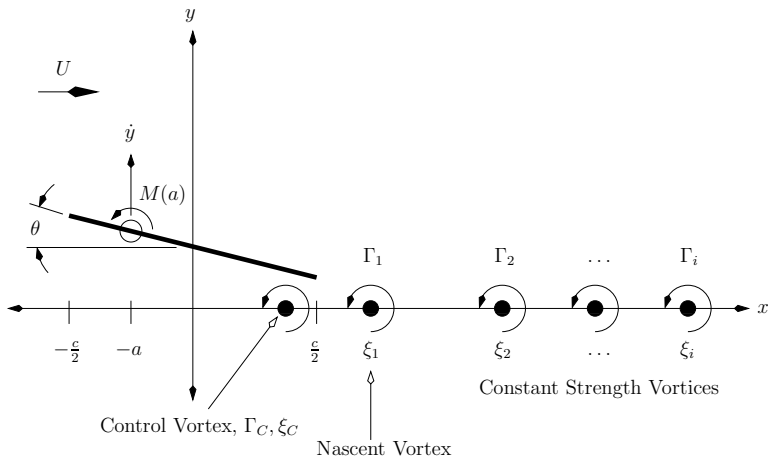
$$M = QS \bar{c} \left(C_{M_0} + C_{M_\alpha} \alpha + \frac{\bar{c}}{2V_\infty} C_{M_{\dot{\alpha}}} \dot{\alpha} + C_{M_{\delta_a}} \delta_a \right)$$

- Modeling leads to a system model of the form

$$\begin{bmatrix} \dot{y} \\ \ddot{y} \\ \dot{\alpha} \\ \ddot{\alpha} \end{bmatrix} = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & a_{2,2} & a_{2,3} & a_{2,4} \\ 0 & 0 & 0 & 1 \\ 0 & a_{4,2} & a_{4,3} & a_{4,4} \end{bmatrix} \begin{bmatrix} y \\ \dot{y} \\ \alpha \\ \dot{\alpha} \end{bmatrix} + \begin{bmatrix} 0 \\ 0 \\ 0 \\ b_{f,4} \end{bmatrix} \delta_a$$



Concept of Vortex Model



Nonlinear Vortex Model

- From our previous work, we obtained the following lift and moment relations

$$L = -\rho\pi\left(\frac{c^2}{4}\ddot{y} + Uc\dot{y}\right) + \rho\pi\left[\frac{ac^2}{4}\ddot{\theta} + U\left(a + \frac{c}{2}\right)c\dot{\theta} + \left(\frac{\dot{U}c^2}{4} + U^2c\right)\theta\right] - \frac{\rho Uc}{2} \sum_{i=1}^N \frac{\Gamma_i}{\sqrt{\xi_i^2 - c^2/4}} + \rho U \Gamma_C$$

and

$$M(a) = aL + \frac{\rho\pi Uc^2}{4}\dot{y} + \rho\pi\left[\frac{c^4}{128}\ddot{\theta} - \frac{Uac^2}{4}\dot{\theta} - \frac{U^2c^2}{4}\theta\right] + \frac{\rho Uc^2}{8} \sum_{i=1}^N \frac{\Gamma_i}{\sqrt{\xi_i^2 - c^2/4}} + \rho U \Gamma_C \xi_C$$



Nonlinear Vortex Model

- The shed vortex positions, ξ_i , were given by

$$\frac{d\xi_1}{dt} = U - \frac{(\xi_1^2 - c^2/4)}{\xi_1 \Gamma_1} \frac{d\Gamma_1}{dt}$$

$$\frac{d\xi_i}{dt} = U \quad (i \geq 2)$$

- The vortex strengths, Γ_i , were defined by

$$\Gamma_1 = -\sqrt{\frac{\xi_1 - c/2}{\xi_1 + c/2}} \left(\Gamma_0 + \sum_{i=2}^N \sqrt{\frac{\xi_i + c/2}{\xi_i - c/2}} \right)$$

$$\Gamma_i = \text{Constant}$$



Corrections for Thickness and Camber

- Corrections needed for accurate simulation.
- Corrections based on NASA legacy data.
- Effect of thickness and camber is to translate lift and moment curves.
- Lift changes as

$$\tilde{L} = L + \left(\frac{1}{2} \rho U^2 c \right) C_{L,0}$$

- Moment changes as

$$\tilde{M} = M - \left(\frac{1}{2} \rho U^2 c^2 \right) C_{M,0} + \left(a - \frac{c}{4} \right) \left(\frac{1}{2} \rho U^2 c \right) C_{L,0}$$

- In our experiments, the c.g. is close to quarter chord and M simplifies since $\left(a - \frac{c}{4} \right) \approx 0$



Linear Model Development

- Vortex model captures dynamics that are negligible on time scales of rigid body dynamics.
- We define a characteristic circulation as

$$\Gamma_w = c \sum_{i=1}^N \frac{\Gamma_i}{\sqrt{\xi_i^2 - c^2/4}}$$

- We consider the lift and moment generated when impulsively started from rest
 - $d\Gamma_w/dt = 0$.
 - Only a single vortex is created.



Linear Model Development (cont.)

- This gives the lift as

$$L = -\rho U \left(\Gamma_0 - \frac{1}{2} \Gamma_W \right)$$

- At $t = t_0$, $\Gamma_W \approx -\Gamma_0$.
- When $t \rightarrow \infty$, Lift terms should disappear as wake vortices move downstream.
- To model as linear, we propose the following model

$$\frac{d\Gamma_W}{dt} = -\frac{d\Gamma_0}{dt} - \beta \Gamma_W$$

where β is a constant and the initial condition of the differential is

$$\Gamma_W(t_0) = \Gamma_0(t_0)$$



The Linear Model

- This induces an exponential rise in lift $(1 - e^{\beta t})$ for a constant Γ_0 .
 - This is contrary to the classical square root type growth for lift.
 - This is contrary to the decay in lift that is geometric at best.
- One can compute the best fit for β at a given Δt .
- Hence, the “linearized” characteristic circulation is

$$\dot{\Gamma}_W + \beta \Gamma_W = -\pi c \left(\ddot{y} + \left(a + \frac{c}{4} \right) \ddot{\theta} + U \dot{\theta} \right)$$

with an initial condition of

$$\Gamma_W(t_0) = -\pi c \left(\ddot{y} + \left(a + \frac{c}{4} \right) \ddot{\theta} + U \dot{\theta} \right) \Big|_{t=t_0}$$



Linear Lift/Moment Relationships

- The lift and moment expressions simplify to:

$$L = -\rho\pi \left(\frac{c^2}{4} \ddot{y} + Uc\dot{y} \right) - \rho U \left(\frac{1}{2} \Gamma_w + \Gamma_c \right) \\ - \rho\pi \left[\frac{ac^2}{4} \ddot{\theta} + U \left(a + \frac{c}{2} \right) c\dot{\theta} + \left(\frac{\dot{U}c^2}{4} + U^2c \right) \theta \right]$$

and

$$M = aL + \frac{\rho\pi Uc^2}{4} \dot{y} + \rho\pi \left[\frac{Uac^2}{4} \dot{\theta} + \frac{U^2c^2}{4} \theta - \frac{ac^2}{128} \ddot{\theta} \right] \\ + \rho U \left(\frac{c}{8} \Gamma_w - \Gamma_c \xi_c \right)$$

The above equations include added mass, quasi-steady lift, lift due to wake, and control terms.

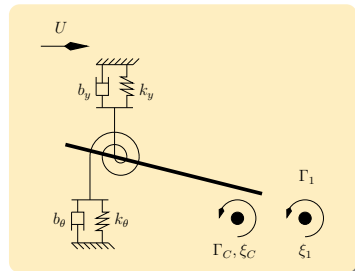


Coupled Model Assumptions

- Assume the rigid body dynamics are given by

$$\begin{aligned} m\ddot{y} + b_y\dot{y} + k_y y &= L \\ I\ddot{\theta} + b_\theta\dot{\theta} + k_\theta\theta &= M(a) \end{aligned}$$

- L is the lift.
- $M(a)$ is the moment about the location a .
- Neglect thickness and camber corrections for control design purposes.



Redefining Lift and Moment as Matrix Equations

- The "Linear" Vortex Model can be written as

$$\dot{x} = Ax + B\Gamma_C$$

where $x = [y \ \theta \ \dot{y} \ \dot{\theta} \ \Gamma_w]^T$.

- How does Γ_C relate to the physical world?
- Γ_C can be related to applied moment as

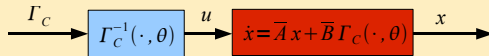
$$\Gamma_C(u_f, \theta) = \frac{1}{2} U_c \left(\frac{a + \xi_C}{c} \right) \Delta C_M(u_f, \theta)$$

- $C_M(u_f, \theta)$ is determined from static experimental data.
- Hence, the model becomes nonlinear!
- Luckily, $\Gamma_C(u_f, \theta)$ is invertible for fixed θ .



Nominal Control Designs

- The vortex model is nonlinear.
- $\Gamma_C(u_f, \theta)$ is invertible for fixed θ
- We employ an inversion technique to make the control design effectively linear.



- Inversion of $\Gamma_C(u_f, \theta)$ is pre-computed in a lookup table.
- Now, one can use standard linear analysis tools to develop control laws based on the static actuator model and the vortex model.



Linear Control Law Design

- Defining the tracking error

$$e = y - r$$

- We must design a control law to ensure

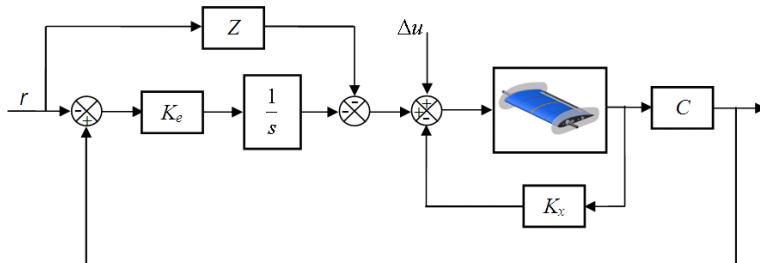
$$e(t) \rightarrow 0 \text{ as } t \rightarrow \infty$$

- Using a modified robust servomechanism LQR like formulation, feedback gains, K_e and K_x , are computed.
- Results in a control law of the form

$$u = -K_e \int_0^t e(\tau) d\tau - K_x x + Zr$$



Nominal Control Architecture



Robust Servo LQR with feedforward element



Avoiding State Estimation for Vortex Control Law

- State feedback is not possible for vortex model.
- Aerodynamic state is unmeasurable.
- We modify the nominal vortex design using projective control.
- Augmenting the model dynamics with the control law dynamics, the closed loop system is given by

$$\begin{bmatrix} e \\ \dot{x} \end{bmatrix} = \begin{bmatrix} 0 & C \\ -\bar{B}K_e & \bar{A} - \bar{B}K_x \end{bmatrix} \begin{bmatrix} \int e \\ x \end{bmatrix} + \begin{bmatrix} -1 \\ \bar{B}Z \end{bmatrix} r$$

$$y = \begin{bmatrix} 0 & C \end{bmatrix} \begin{bmatrix} e \\ x \end{bmatrix}$$

where C is a matrix that multiplied by x gives the position.



Avoiding State Estimation for Vortex Control Law

- We can retain all but one of the closed loop eigenvalues.
- Let $K = [K_e \ K_x]$ and X_y be the eigenvectors corresponding to the closed loop eigenvalues we wish to retain.
- The required output feedback gain is given by

$$\bar{K} = KX_y (\bar{C}_{measured}X_y)^{-1}$$

where $\bar{C}_{measured}$ corresponds to the rigid body states of x .

New Output Feedback Vortex Control Law

$$u = -K \begin{bmatrix} \int e \\ y_{measured} \end{bmatrix} + Zr$$



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Plant Dynamics/Reference Behavior

- We assume that our plant can be expressed as

$$\begin{aligned}\dot{x}(t) &= Ax(t) + B\Lambda[\Gamma_C(t) + f(x, \Gamma_C)] \\ y(t) &= Cx(t)\end{aligned}$$

- The nominal control law can be expressed as

$$\Gamma_{C,n} = -K_y y + K_r r$$

- Assuming $f(x, \Gamma_C) = 0$, we form the desired behavior

$$\begin{aligned}\dot{x}_m(t) &= A_m x_m(t) + B_m r \\ y_m(t) &= C x_m(t)\end{aligned}$$

where $A_m = A - BK_r$ is Hurwitz and $B_m = BK_r$.



Approximating System Uncertainty

- We want to design an adaptive signal $\Gamma_{C,ad}$ to approximately cancel the modeling error $f(x, \Gamma_C)$.
- The total control effort becomes

$$\Gamma_C(t) = \Gamma_{C,n}(t) - \Gamma_{C,ad}(t)$$

- We will try to approximate $\Lambda f(x, \Gamma_C)$ with a SHL neural network

$$\Lambda f(x, u) = W^T \bar{\sigma}(V^T \eta(t)) + \epsilon(x, u), \quad (x, u) \in \mathcal{D}_x \times \mathcal{D}_u$$

where ϵ , W , and V are unknown but bounded.

- We reconstruct the nonlinearity via delayed values of system outputs and inputs as inputs to the neural network ($\eta(t)$).



Error Observer

- Since all of the states are not observable, we need an error observer.

$$\begin{aligned}\dot{\xi} &= A_m \xi + L(y - y_\xi - y_m) \\ y_\xi &= C\xi\end{aligned}$$

where $\tilde{A} = A_m - LC$ is Hurwitz and satisfies the following Lyapunov equation

$$\tilde{A}^T \tilde{P} + \tilde{P} \tilde{A} = -\tilde{Q}, \quad \tilde{Q} = \tilde{Q}^T > 0, \quad \tilde{Q} \in \mathbb{R}^{n \times n}$$

- The observer allows us to estimate the error state, $x_m - x$, of the system.



Adaptive Weight Update Laws

- The adaptive update laws are

$$\dot{\hat{W}}(t) = -\Gamma_W Proj \left[\hat{W}(t), \tilde{\sigma} \left(\hat{V}(t), \eta(t) \right) \xi(t)^T PB \right]$$

$$\dot{\hat{V}}(t) = -\Gamma_V Proj \left[\hat{V}(t), \eta(t) \xi^T PBH \left(\hat{W}(t), \hat{V}(t), \eta(t) \right) \right]$$

$$\dot{\delta \hat{\Lambda}}^T(t) = -\Gamma_\delta Proj \left[\delta \hat{\Lambda}^T(t), u(t) \xi^T(t) PB \right]$$

where

$$\tilde{\sigma} \left(\hat{V}(t), \eta(t) \right) = \bar{\sigma} \left(\hat{V}(t)^T \eta(t) \right) - \bar{\sigma}' \left(\hat{V}(t), \eta(t) \right) \hat{V}^T(t) \eta(t)$$

$$H \left(\hat{W}(t), \hat{V}(t), \eta(t) \right) = \hat{W}^T(t) \bar{\sigma}' \left(\hat{V}(t), \eta(t) \right)$$

- These laws use parameter projection.
- See the paper for additional details.

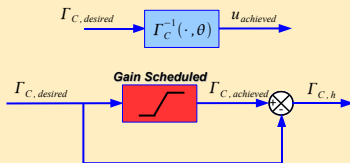


Compensating for Saturation

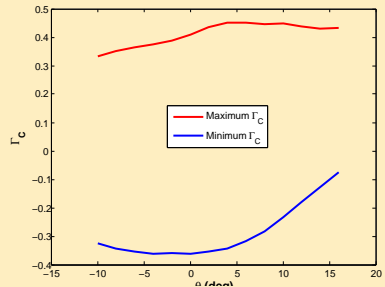
- Hedged reference model

$$\dot{x}_m = A_m x_m + B_m r + B_h \Gamma_{C,h}$$

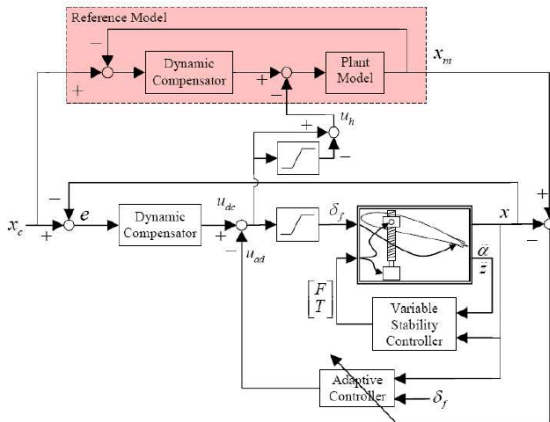
Scheduled Control Hedging



Gain Map for Hedging



System Conceptual Review



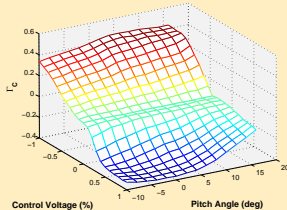
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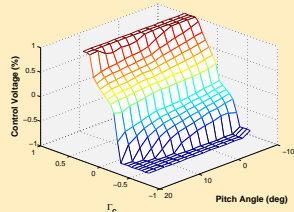
Model Validation

- Static actuator model parameters were determined from static tests.
- Γ_C map was determined from static pitching moment measurements.

Measured $\Gamma_C(u_f, \theta)$



Saturated $\Gamma_C^{-1}(u_f, \theta)$



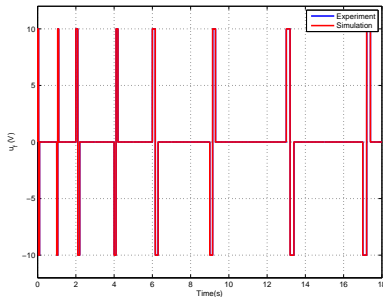
- Saturation of Γ_C ensures invertability.



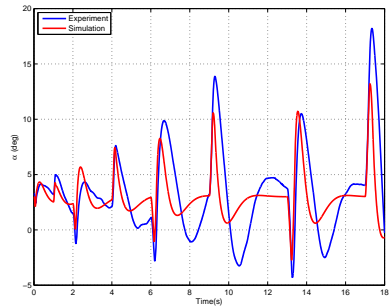
Model Validation

- Experiment response to open loop actuator excitation has been compared with simulation results.

Flow Control Input Voltage



Pitch Response Comparison

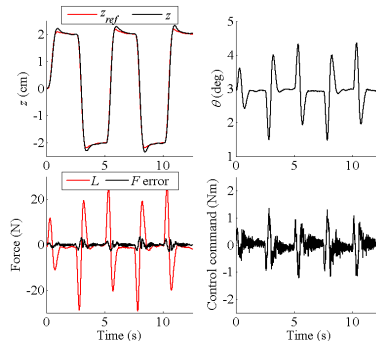


- The vortex ROM performs significantly better than the static actuator model.



Torque Motor Case

- Lets look at the flight response using a torque motor for actuation.



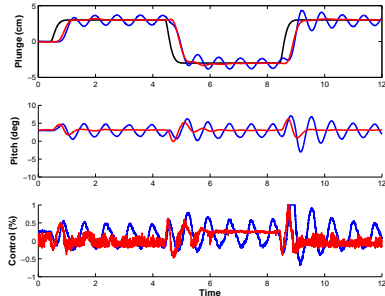
- This indicates that the experiment is closely representing a free flying wing.



Control Law Comparisons

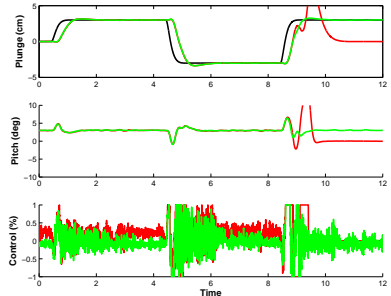
• Square Wave Tracking:

Linear Model Failure



— **Command**
— **Adaptive Control Law**

Vortex Model Failure

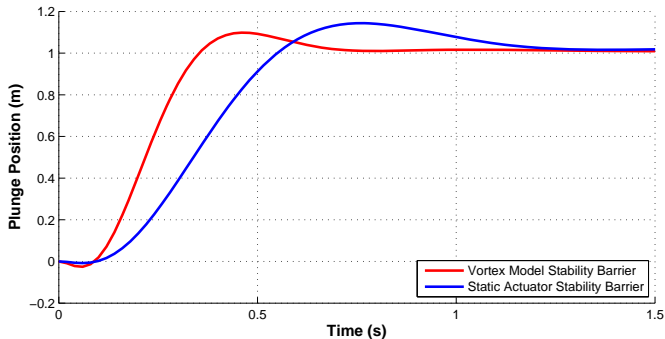


— **Static Actuator**
— **Vortex ROM**



Rise Time Stability Barrier

- Rise time: 10% – 90%
- Static actuator limit: 0.31 sec
- Linear vortex model limit: 0.19 sec



Disturbance Rejection



Conclusions

- Demonstrated closed loop longitudinal control of a wing model using synthetic jet type actuation.
- As the wing moves faster, the actuators can no longer be considered static.
- Simple vortex model developed to allow linear control designs to reach higher bandwidth.
- Unmodeled dynamics destabilize linear control designs at a high enough bandwidth.
- Adaptive control is able to deal with unmodelled dynamics and maintain stability.



Questions?

